

# **ANN-Presentation**

JBJI - Computational Intelligence

## **CONTENTS**

01 RNNbased Model

02

Seq2Seq Structure 03

Time-Series Prediction 04

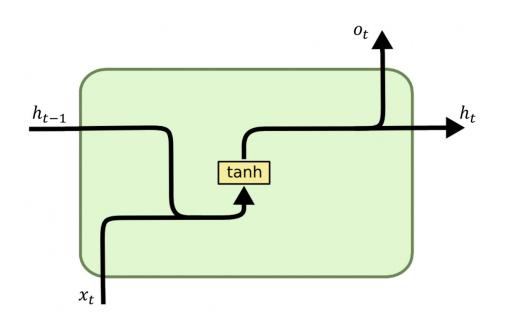
Vessel Trajectory Prediction

# 01

## **RNN-based Model**

### **Recurrent Neural Network**





#### Feed-Forward

$$h_t = \sigma_h(i_t) = \sigma_h(U_h x_t + V_h h_{t-1} + b_h)$$
$$y_t = \sigma_y(a_t) = \sigma_y(W_y h_t + b_h)$$

### **Backpropagation**

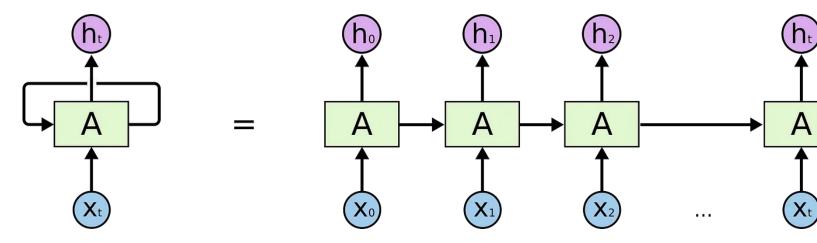
$$\Pi_t = \frac{\partial E_t}{\partial o_t} \frac{\partial o_t}{\partial h_t} + \frac{\partial h_{t+1}}{\partial h_t} \Pi_{t+1}$$

$$\beta_t^U = \beta_{t+1}^U + \Pi_t \frac{\partial h_t}{\partial U_t}$$

$$\beta_t^V = \beta_{t+1}^V + \Pi_t \frac{\partial h_t}{\partial V_t}$$

$$\beta_t^W = \beta_{t+1}^W + \frac{\partial E_t}{\partial o_t} \frac{\partial o_t}{\partial W_t}$$

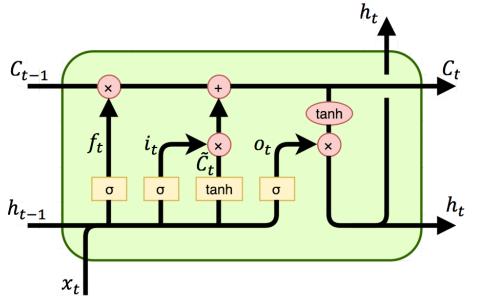
$$\frac{\partial E}{\partial X} \equiv \beta_0^x$$



## **Long-Short Term Memory**



#### Feed-Forward



#### **Backpropagation**

$$\frac{\partial C_{t+1}}{\partial h_t} = \frac{\partial C_{t+1}}{\partial \tilde{C}_{t+1}} \frac{\partial \tilde{C}_{t+1}}{\partial h_t} + \frac{\partial C_{t+1}}{\partial f_{t+1}} \frac{\partial f_{t+1}}{\partial h_t} + \frac{\partial C_{t+1}}{\partial t_{t+1}} \frac{\partial i_{t+1}}{\partial h_t} \qquad o_t = \sigma(W_o \cdot [h_{t-1}, x_t] + b_o)$$

$$\frac{\partial C_{t+1}}{\partial C_t} = \frac{\partial C_{t+1}}{\partial C_t} \qquad \tilde{C}_t = \tanh(W_c \cdot [h_{t-1}, x_t] + b_o)$$

$$\tilde{C}_t = \tanh(W_c \cdot [h_{t-1}, x_t] + b_o$$

$$\tilde{C}_$$

$$f_t = \sigma(W_f \cdot [h_{t-1}, x_t] + b_f)$$

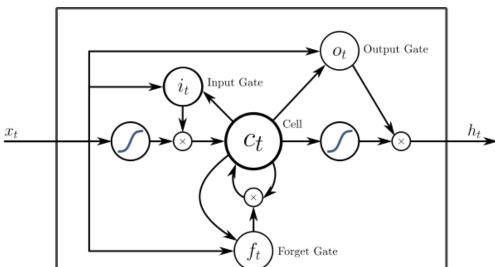
$$i_t = \sigma(W_i \cdot [h_{t-1}, x_t] + b_i)$$

$$o_t = \sigma(W_o \cdot [h_{t-1}, x_t] + b_o)$$

$$\tilde{C}_t = \tanh(W_c \cdot [h_{t-1}, x_t] + b_c)$$

$$C_t = f_t \odot C_{t-1} + i_t \odot \tilde{C}_t$$

$$h_t = o_t \odot \tanh(C_t)$$



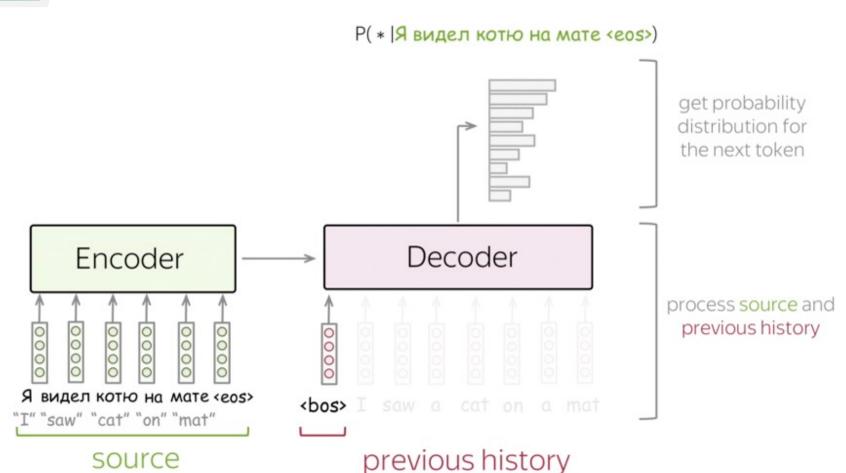
- 1. **Input Gate**: Determines which parts of the new information should be added to the cell state. It filters the information through a set of operations, allowing only important information to pass through this gate.
- Forget Gate: Decides which information in the cell state should be discarded or retained. If the forget gate is closed, information is retained; if open, it is forgotten.
- 3. Output Gate: Determines which parts of the cell state should be output to the next hidden layer. It filters the cell state to determine the final output values.

# 02

# Seq2Seq Structure

## **Sequence to Sequence**





### **Human Translation**

$$y^* = \arg\max_{y} p(y|x)$$

The "probability" is intuitive and is given by a human translator's expertise

#### **Machine Translation**

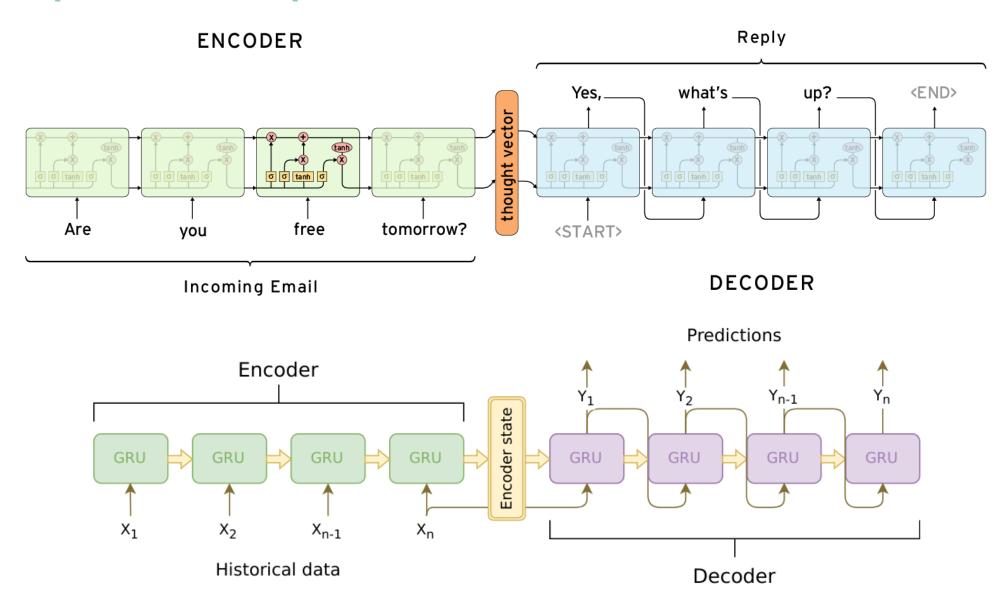
$$y' = \arg\max_{y} p(y|x, \theta)$$

$$Loss(p^*,p) = -p^* \log(p) = -\sum_{i=1}^{|V|} p_i^* \log(p_i).$$

$$Loss(p^*,p) = -\log(p_{y_t}) = -\log(p(y_t|y_{< t},x)).$$

## Sequence to Sequence







## Time Series Prediction

## **Background**



#### 2022 MCM Problem C: Trading Strategies



#### **Background**

Market traders buy and sell volatile assets frequently, with a goal to maximize their total return. There is usually a commission for each purchase and sale. Two such assets are gold and bitcoin.



**Figure 1:** Gold daily prices, U.S. dollars per troy ounce. Source: London Bullion Market Association, 9/11/2021

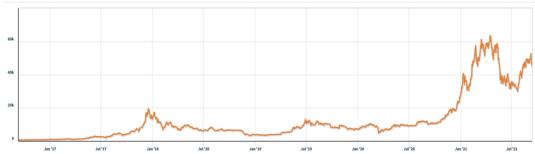
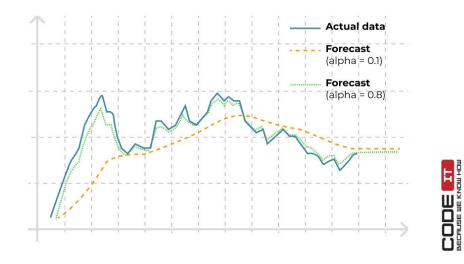


Figure 2: Bitcoin daily prices, U.S. dollars per bitcoin. Source: NASDAQ, 9/11/2021



#### **EXPONENTIAL SMOOTHING MODEL**





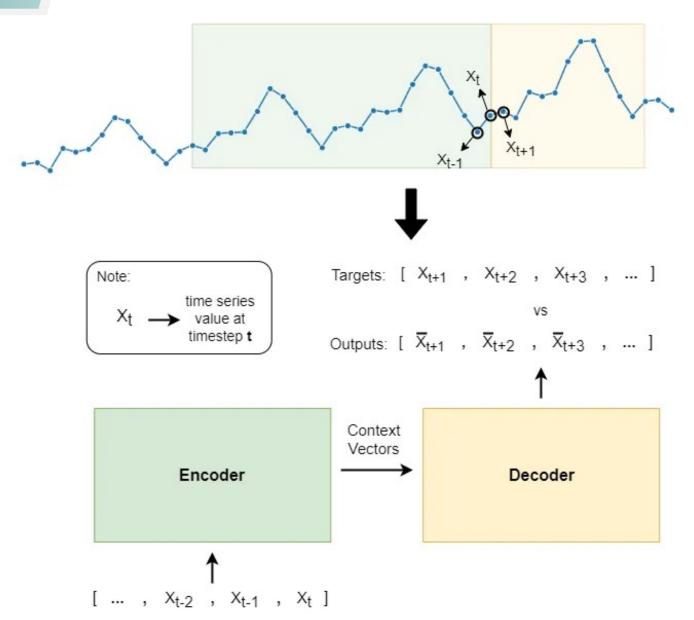
## **Sequential Data**

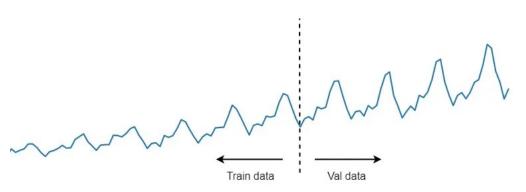


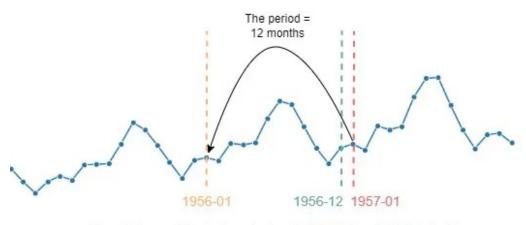


## **Seq2Seq For TS Prediction**









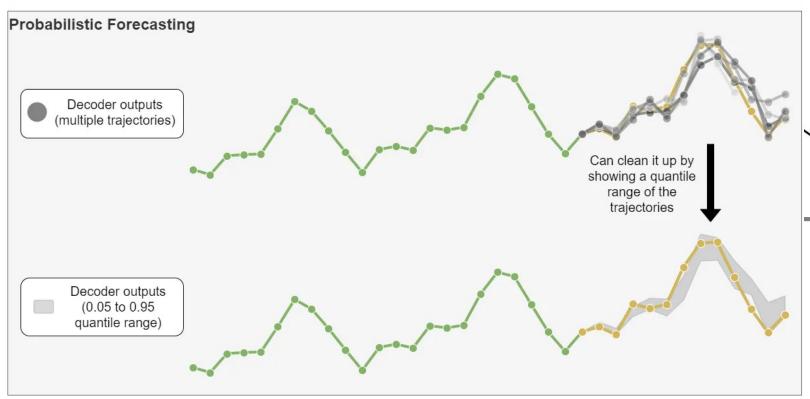
To assist in predicting the target value at 1957-01 from 1956-12, also take as input the target's corresponding previous period value at 1956-01

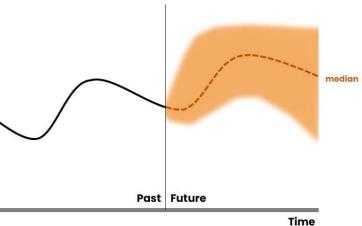
### **Prediction Details**





#### **Deterministic forecast**





# 04

# Vessel Trajectory Prediction



**Definition 1.** (Vessel trajectory): A track point is defined as a tuple  $x_t = (LON_t, LAT_t, SOG_t, COG_t, DIS_t)$  at the time of t in which  $x_t$  is composed of longitude  $LON_t$ , latitude  $LAT_t$ , speed  $SOG_t$ , course  $COG_t$ , and sailing distance  $DIS_t$  respectively, and a vessel trajectory  $X = (x_{t_0}, x_{t_1}, \ldots, x_{t_n})$  is defined as a sequence of these points arranged in chronological order where  $\{t_i, i = 0, 1, 2, \ldots, n\}$  is a set of timestamps.

Historical Trajectory (1st )

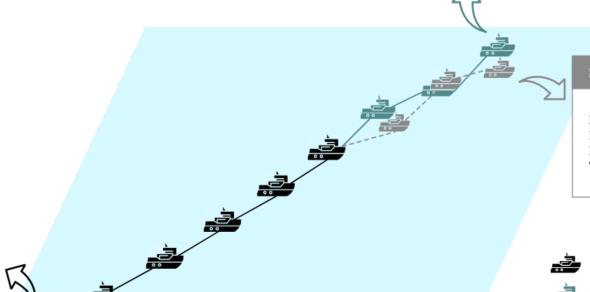
Sailing Distance: 0.50 km Time: 2021-11-14 23:50:02

MMSI: 366233570 Lon: -124.729 Lat: 43.14398 SOG: 3.837 m/s COG: 15.60°

#### Actual Trajectory (9th )

MMSI: 366233570 Lon: -124.430 Lat: 43.333

Time: 2021-11-15 11:55:46

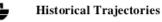


#### Prediction Trajectory (9th)

MMSI: 366233570 Lon: -124.438

Lat: 43.323

Time: 2021-11-15 11:55:46

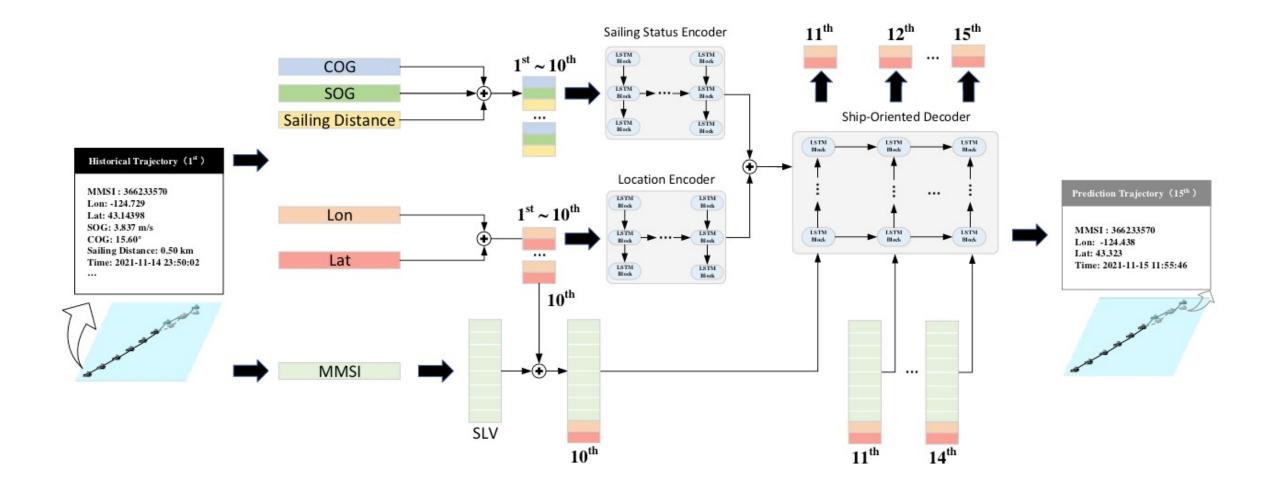


Actual Trajectories

Prediction Trajectories

## Double Encoder Seq2Seq Model

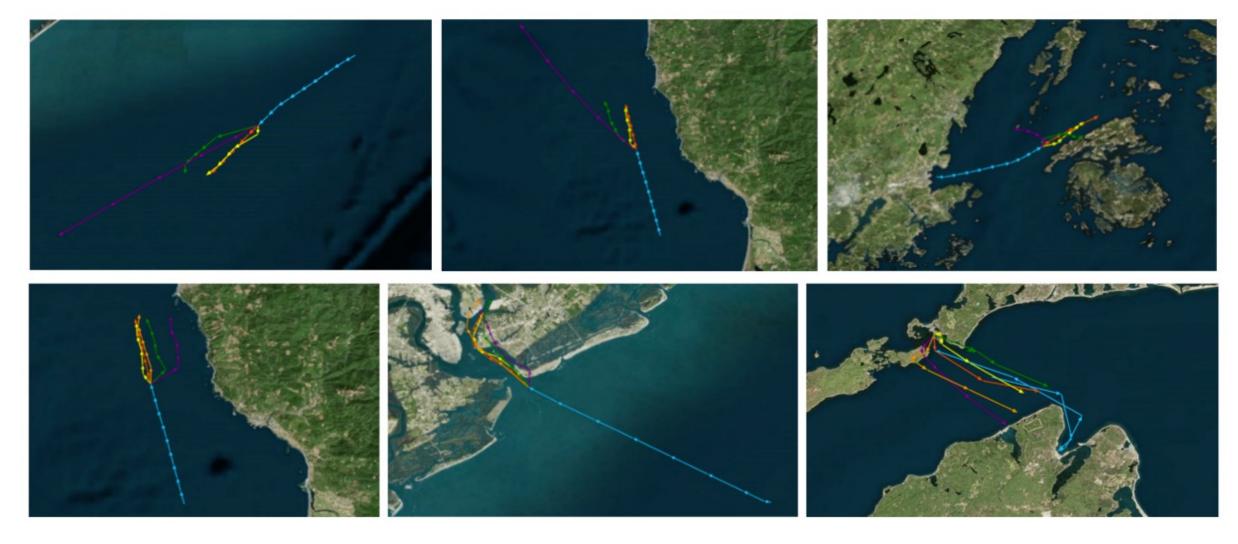






## **Application Scenarios**







# Thanks